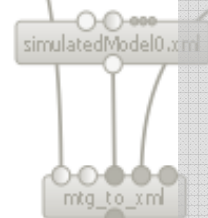
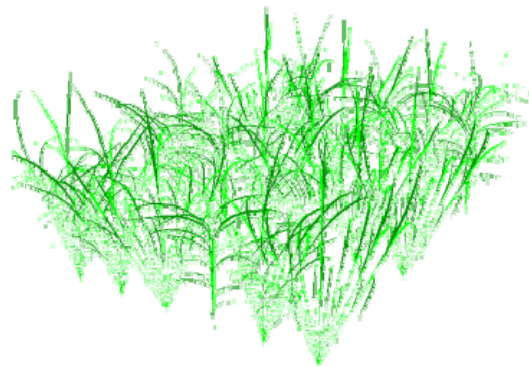


# Phenotyping vs. ideotyping: Opportunities and Limitations of model-assisted crop design drawing from genetic diversity



**Delphine Luquet, Michael Dingkuhn**

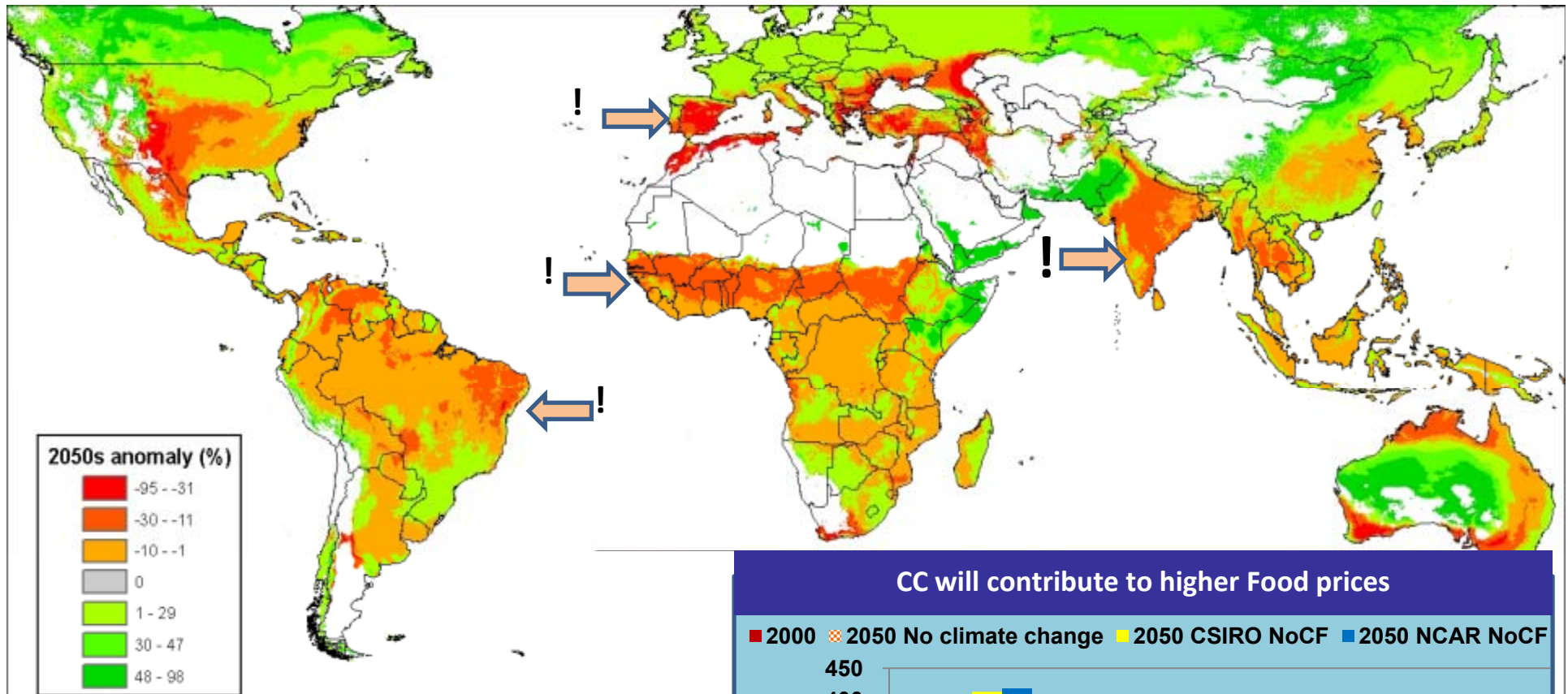
CIRAD, AGAP research unit

Montpellier, France

9th of February 2011

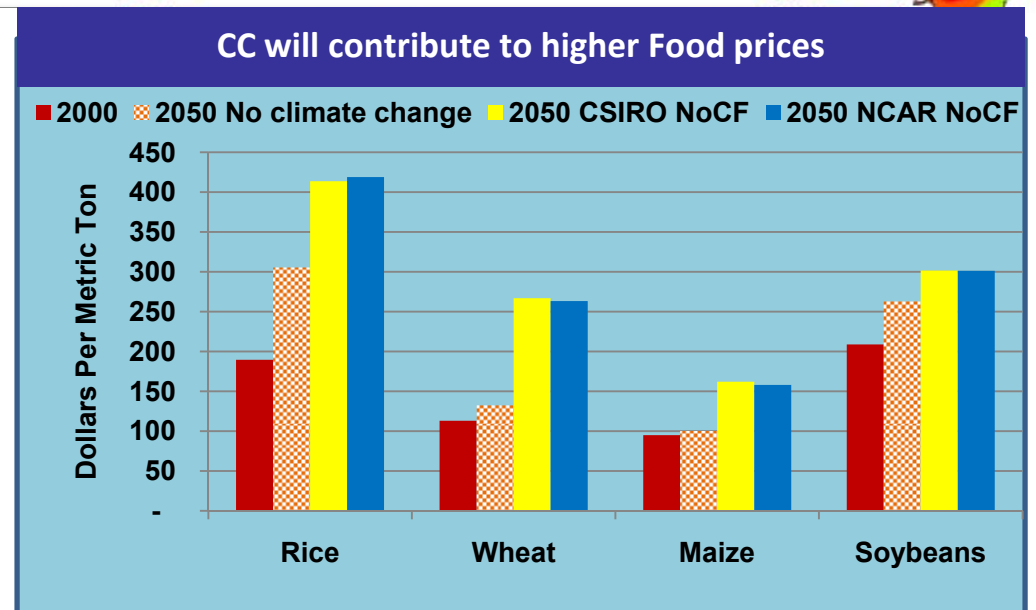


# CC translates into increasing staple food commodity prices



**2050:**  
According to models, a less favorable climate for agriculture (Tropics & subtropics)

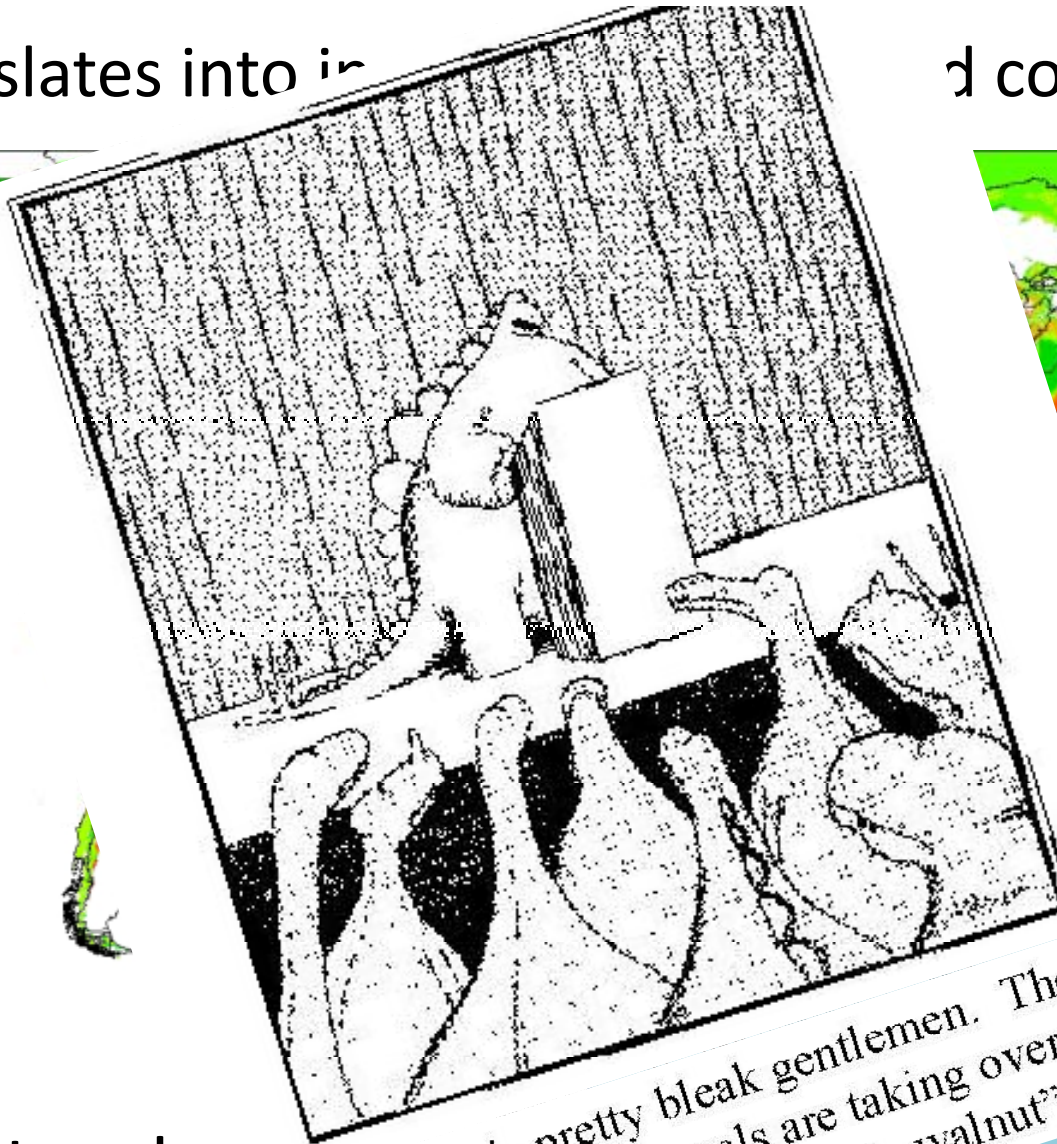
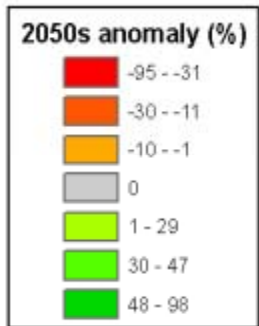
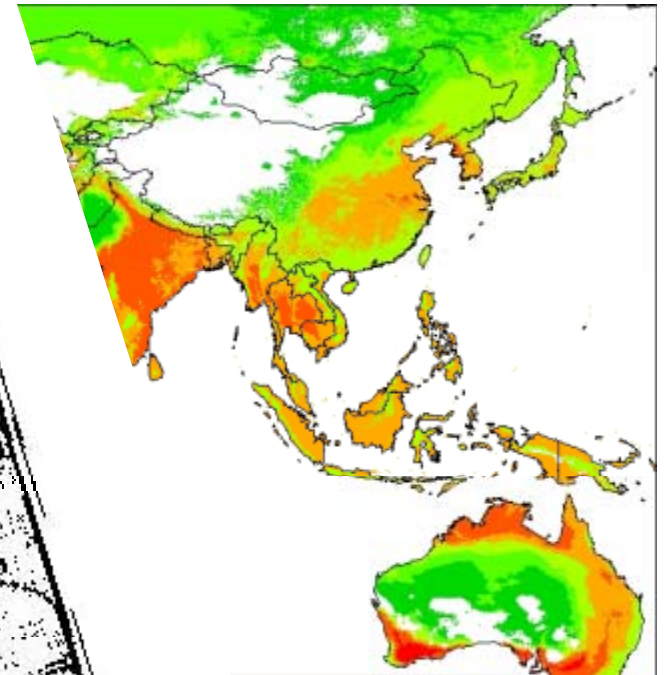
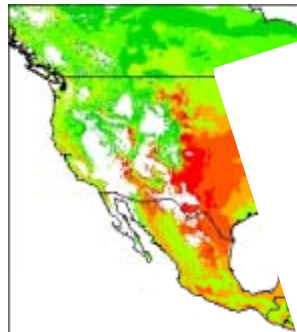
Andrew Jarvis, CIAT/CCAFS





CC translates into in

d commodity prices



2050:

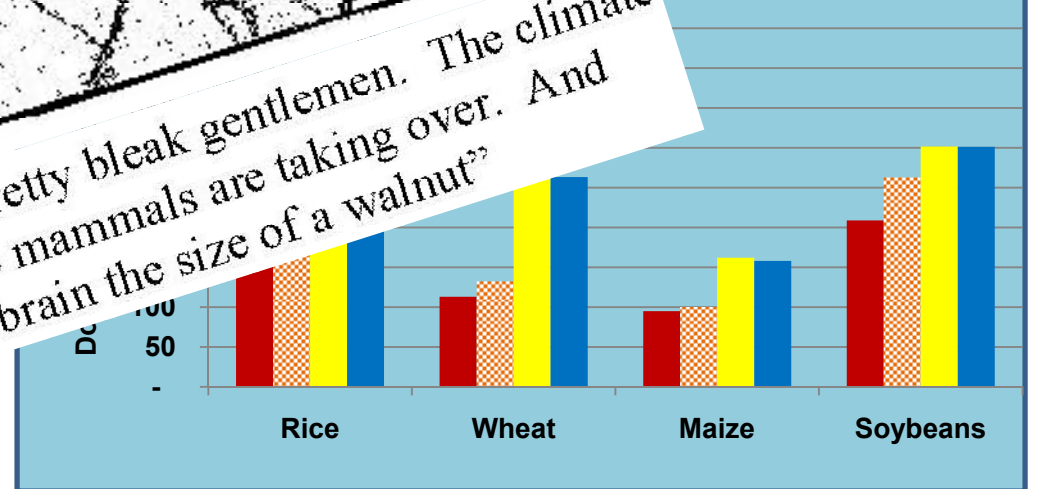
According to model, favorable climate for (Tropics & subtropics,

The picture is pretty bleak gentlemen. The climate is changing. The mammals are taking over. And we've all got a brain the size of a walnut?

Andrew Jarvis, CIAT/CCAFS

Food prices

NoCF 2050 NCAR NoCF



# Talk Structure

## **Crop improvement & CCV**

Place of phenotypic plasticity

## **Plant modeling to support phenotyping and ideotyping**

## **Plant modeling vs. molecular breeding:**

Ongoing research

Understanding genetic & physiological architecture of complex traits

## **Outlook**

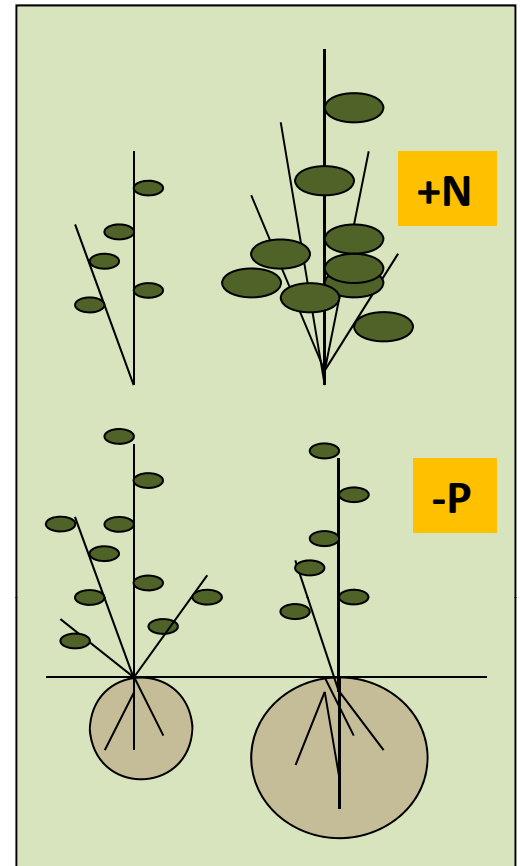
# Crop improvement vs. CCV: Place for phenotypic plasticity

- ☐ What is PP?
  - ☐ Adaptive changes in plant organization during ontogenesis
  - ☐ Broad adaptation through adjustment to variable conditions
- ☐ Why needed under CC?
  - ☐ CC will increase variability
  - ☐ Water will be scarcer (water is a great stabilizer!)
    - ☐ Heat, cold, drought, salinity, soil fertility, weed competition
- ☐ Problem of trade-offs with yield pot.
  - ☐ Plastic plants = variable plant types; at what cost?
- ☐ Problem of trait complexity
  - ☐ How to measure?
  - ☐ Complex genetics?

# Phenotypic plasticity

Inherent capacity to dynamically regulate morphogenesis (Nicotra *et al.* 2010)

- Based on compensatory source-sink processes
- Maintains functioning, reproduction & production when conditions fluctuate
- Includes more than morphology: Phenology, physiological defenses...



## Examples of traits needed under greater climatic variability

### *Phenology*

- Adaptive phase duration (temporal compensation and stress escape)
- Rapid development for vigour and high yield potential under short duration

### *Morphology*

- Architecture limiting stress exposure and maximizing resource efficiency
- Environment responsive morphogenesis

### *Physiology*

- Effective and rapidly inducible tolerance; Hardening?
- Protection of reproductive processes (e.g., cooling of spikelets)

# Implications of phenotypic plasticity

- Increase of G x E
- Intelligent use of G x E through management & forecasts
- Avoid or overcome counter-productive plasticity  
trade-off on yield (Nicotra *et al.* 2010)
- Trade-offs among multiple yield objectives  
e.g. sweet sorghum for 'FFF' (Gutjahr *et al.* 2010)

# Challenge:

Conceive plants having 'productive' plasticity

Lesson from the past: start from available genetic diversity,  
not wishful physiological thinking

Understand physiological and genetic architecture of  
complex traits

Reduce complex traits to component traits, recombine  
intelligently

Give room to discovery, and build it in



# **Plant modeling to support phenotyping & ideotyping**

# Adapting the Ideotype concept

## Morphology & Phenology

- ☐ Green revolution for favorable conditions
  - ☐ Dwarfing => High tillering & HI, less lodging => N responsive
- ☐ Make traditional systems more productive
  - ☐ Combine PP-sensitivity with green revolution traits (African sorghums)



## Morphology, phenology and biochemistry

- ☐ Multi-purpose, new purposes
  - ☐ Grain/forage cowpea, peanut... (FF)
  - ☐ Sweet grain/bioEtOH/forage sorghum (FFF)
  - ☐ Biomass 2nd generation energy Annuals/Trees
  - ☐ C-sequestering food/forage crops



## Most difficult: Change ecophysiological adaptation (T, drought, CO<sub>2</sub>)

- ☐ Combine multiple adaptations with desired plant type
- ☐ Transform metabolic type (C4 rice)
- ☐ Transform harvestable product ('rice'-sorghum?)



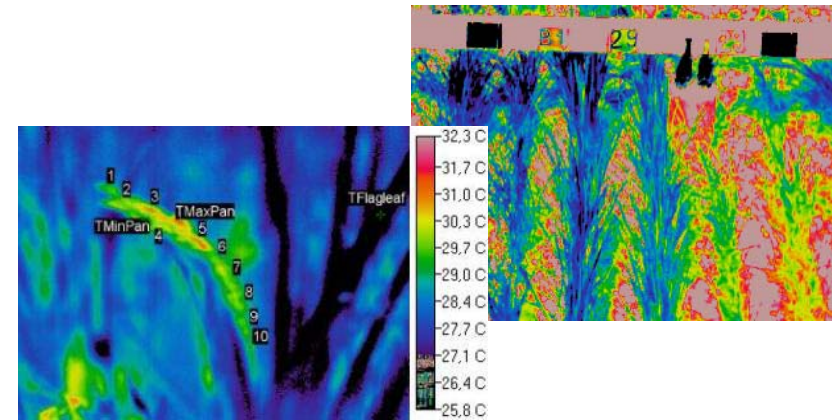
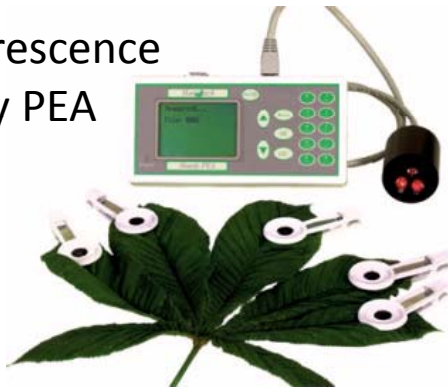
## 3 steps in Ideotype development where crop models can help

- Characterization of Target Populations of Environments (TPE), incl. CC scenarios  
=> Use simple agronomic crop model as “lens”
- Identification of target trait combinations & plant types for TPE  
=> Use crop model with GxExM skills to simulate trait expression & adaptive value
- Phenotyping process => Association studies => Markers  
Heuristics: Extraction of trait parameters from observed variables  
=> Specialized process models with small parameter nb.

# Role of plant physiology and modelling in plant breeding: phenotyping

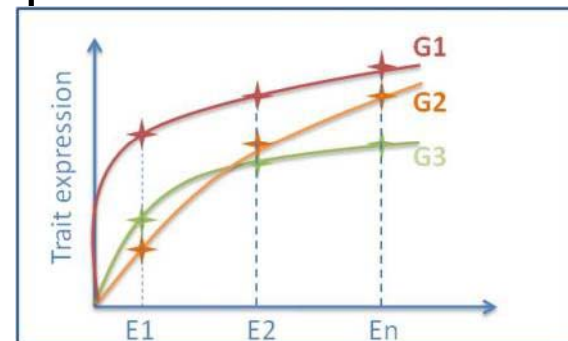
- Novel tools (imagery, remote sensing): maximize data acquisition on large number of plants

Rapid fluorescence  
OJIP Handy PEA



High resolution Thermography

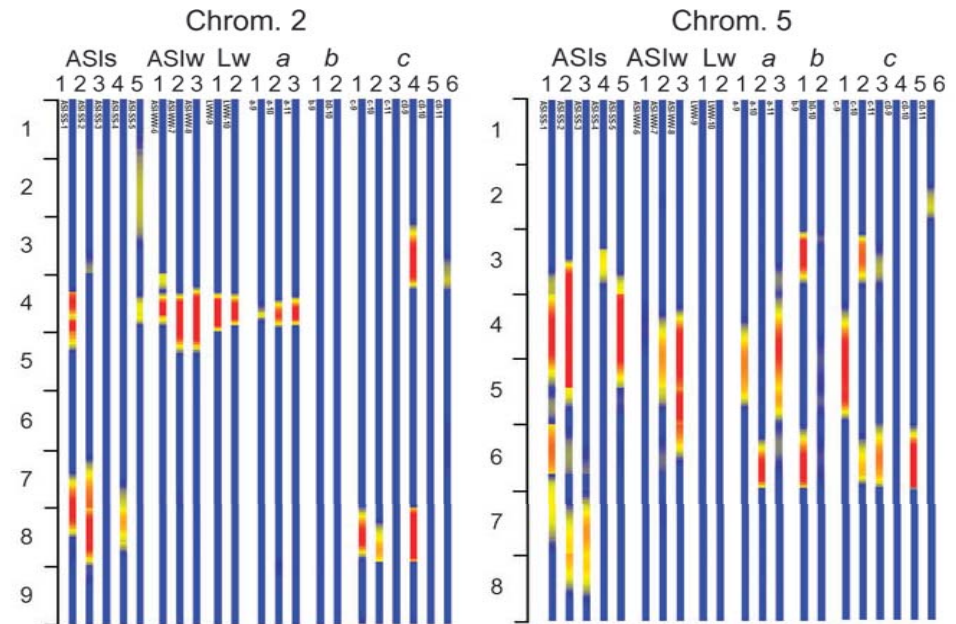
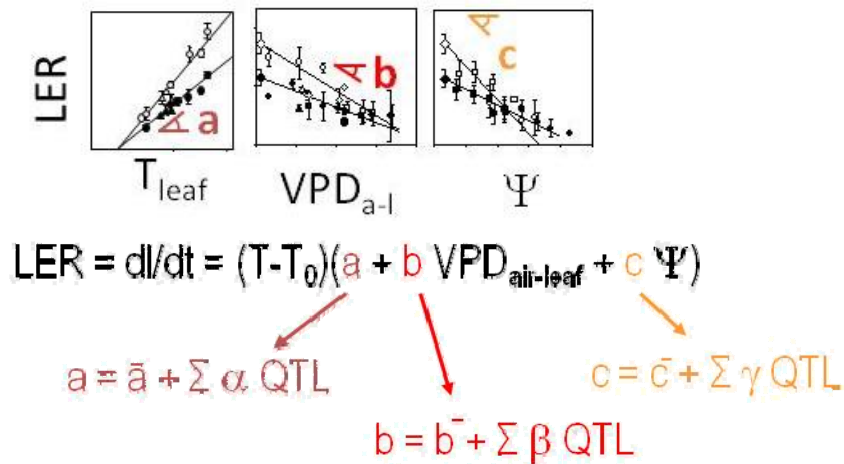
- ⇒ Still need to decorrelate G and E effects (modelling)
- Models needed that analyze & predict G response curve to E through genotypic parameters



# Example of role of modelling in phenotyping

## Leaf expansion rate response to drought variables (maize)

*Raymond et al. (2003, 2004)*



*Welcker et al. 2007*

- ❑ LER model QTLs collocate with that of direct measurements (leaf width)
- ❑ More stable across E : QTLx E overcome (modeling the cause of QTL instability)
- ❑ Validated in contrasting genetic background (temperate to tropical)
- ❑ LER model QTLs collocate with silk expansion QTLs (ASI): 2 crucial traits in 1!

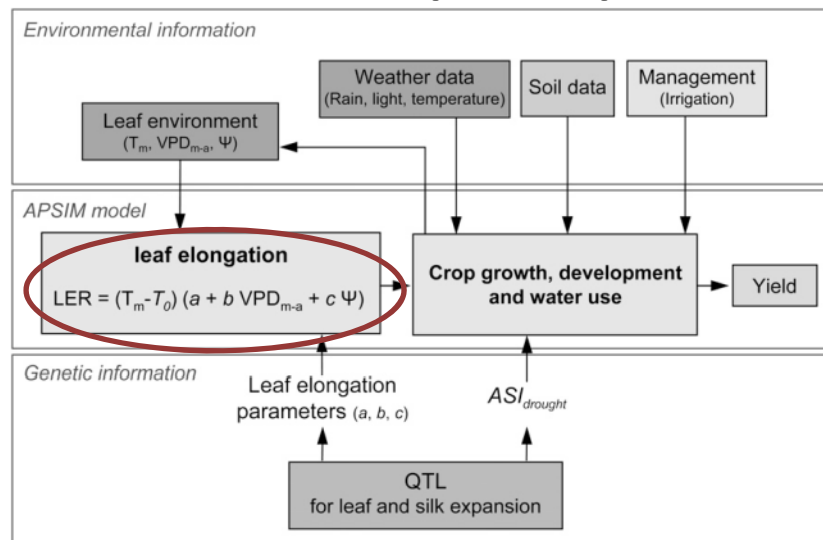
# From relevant QTLs to ideotype: integrative process

- ❑ QTL validation = evaluation at plant/pop. scale (crop performance): **When expressed? When relevant?**
- ❑ Modelling must predict accurate G x E x M interactions and trade-offs (Hammer *et al.* 2010)
- ❑ Even more challenging when addressing CCV (extrapolation)

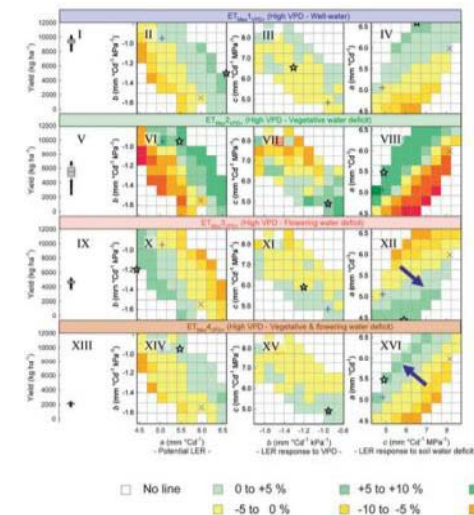


# Example of role of modelling in phenotyping (cont.)

## Incorporation of LER model in APSIM (maize)



## Simulated effect of LER-QTLs on yield

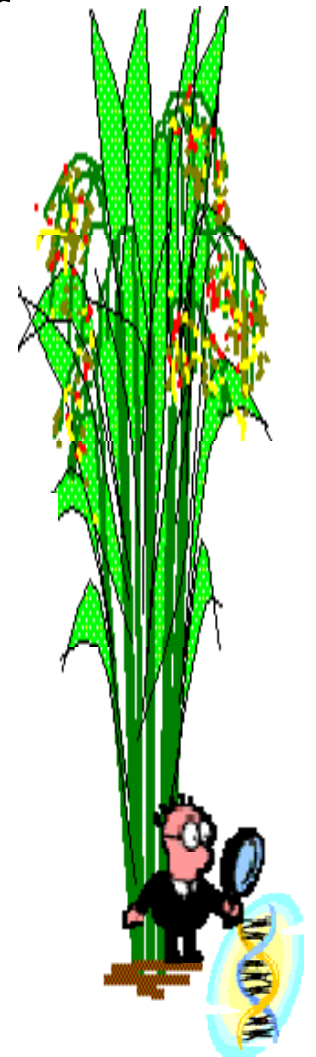


From Chenu et al. 2009 ; Genetics

- ⇒ First real **proof of concept** for **ideotype simulation** using crop models driven by genetic parameters
- ⇒ Doing this for traits for **phenotypic plasticity** requires models with greater detail of trait interactions (morpho/pheno/physio)

# Can plant modeling assist molecular breeding by analyzing genetic & physiological architecture of **complex traits**?

## Ongoing work



## **Vision:**

# **Massive use of molecular markers for agronomic traits and agroecological adaptation**

Rice & sorghum are sequenced

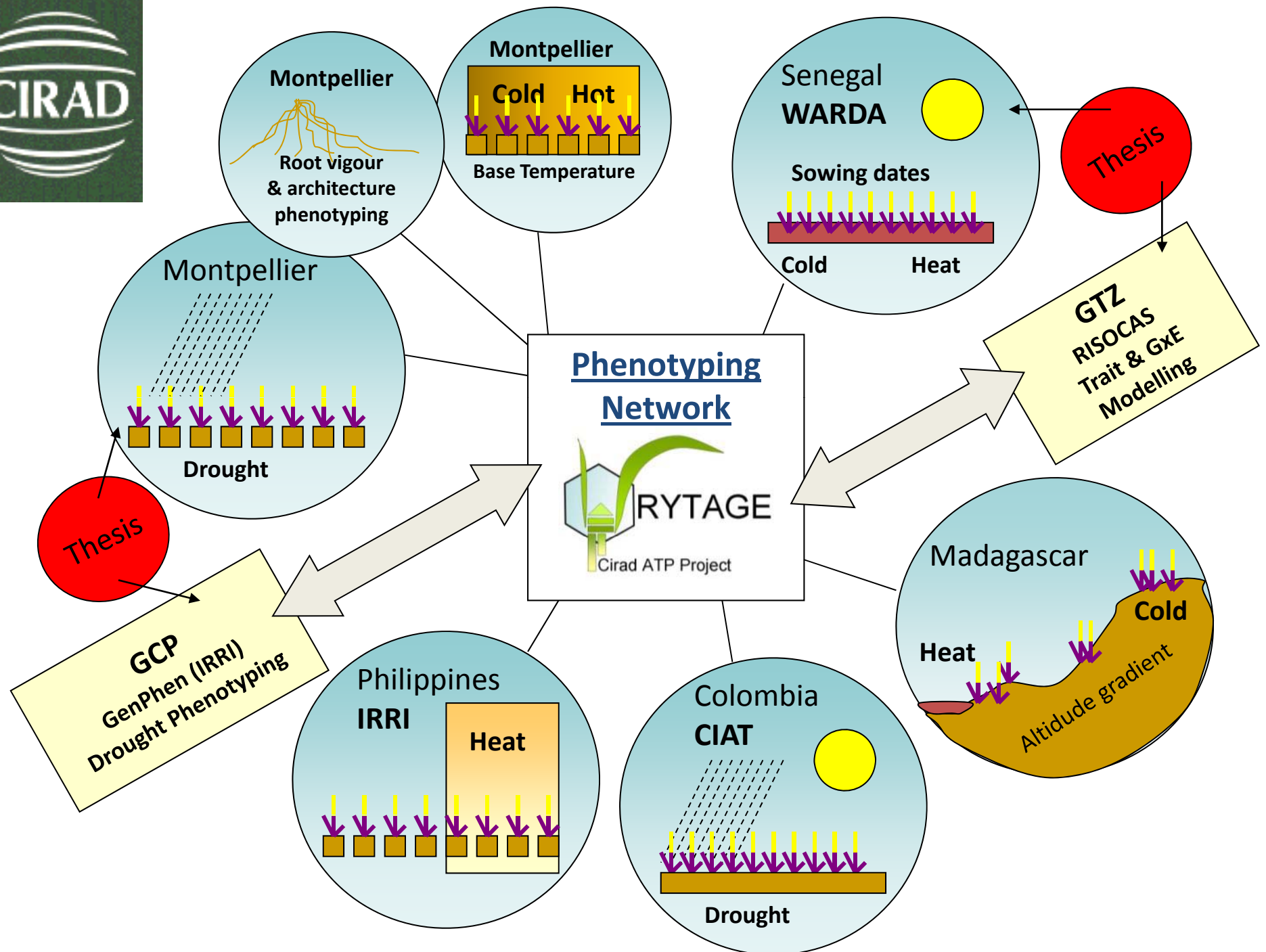
Mass sequencing of rice genomes planned

Sorghum is a major source of genes in C4 rice project

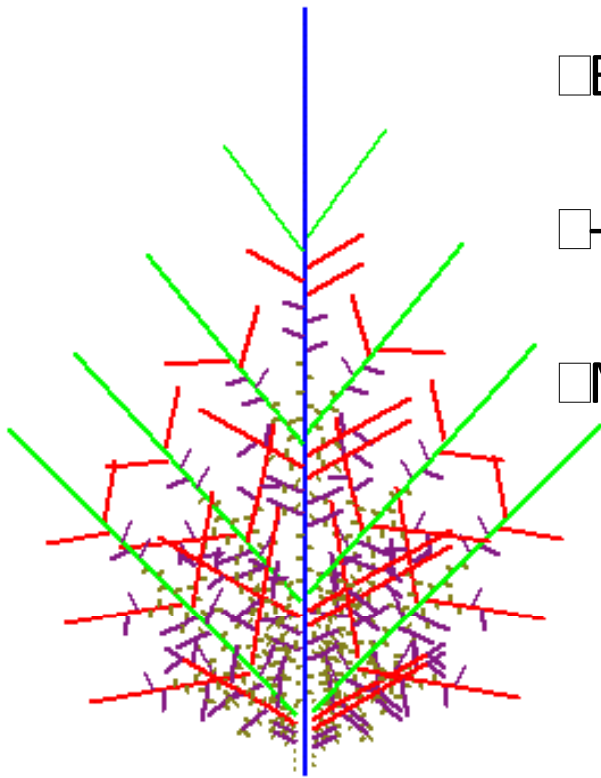
Mass application of MAS in private seed sector

GRiSP plan for global phenotyping & gene discovery & molecular breeding networks

CC&FS plan for ideotype strategies for 2030 CC horizon



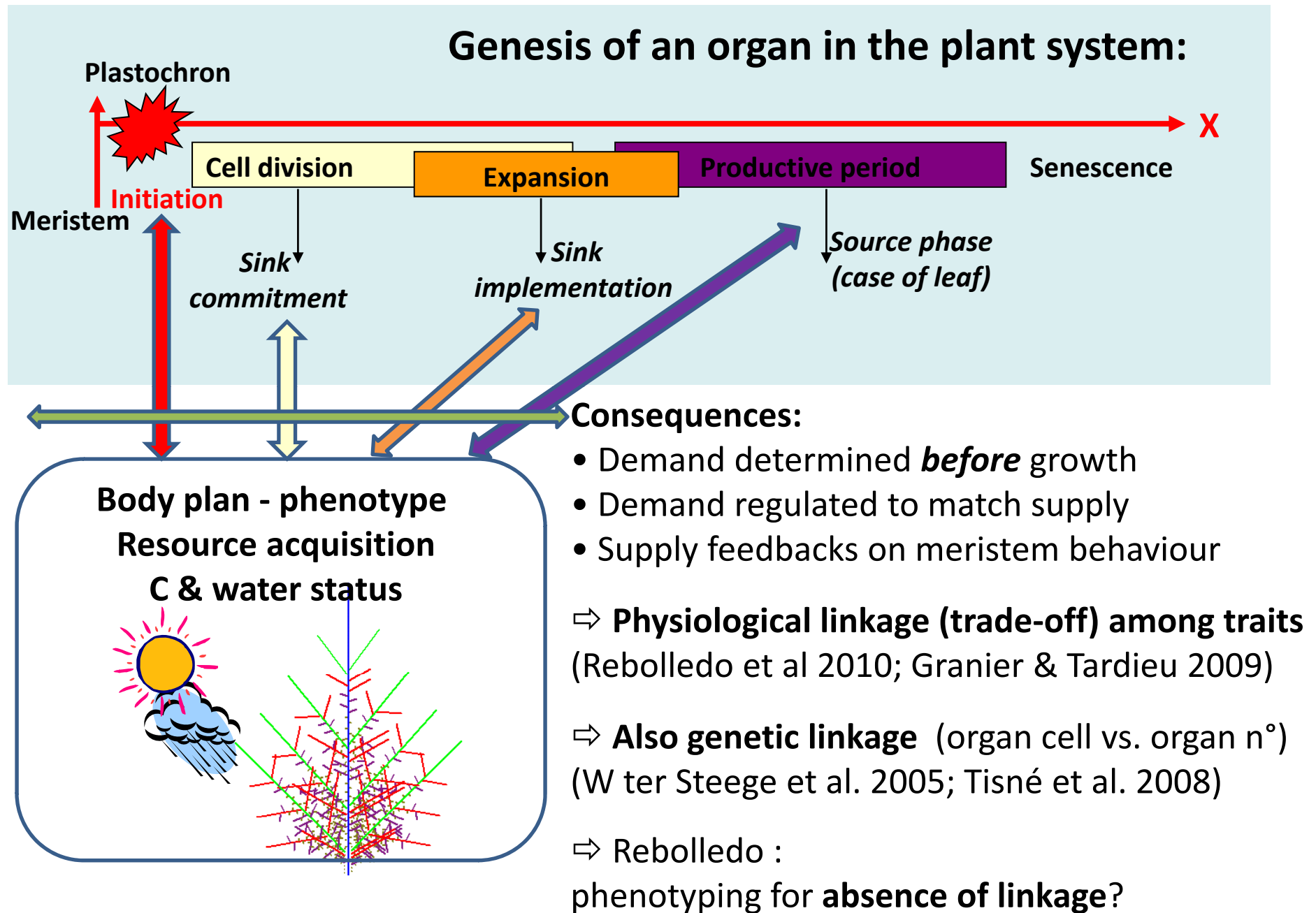
# Dealing with traits regulating whole plant morphogenesis



- Body plan construction
- +/- plastic in response to E depending on G
- Many processes related to **meristem activity**
  - tillering, leaf initiation, size, expansion...

**Important: Simulation of Outcomes vs. Forcing!**

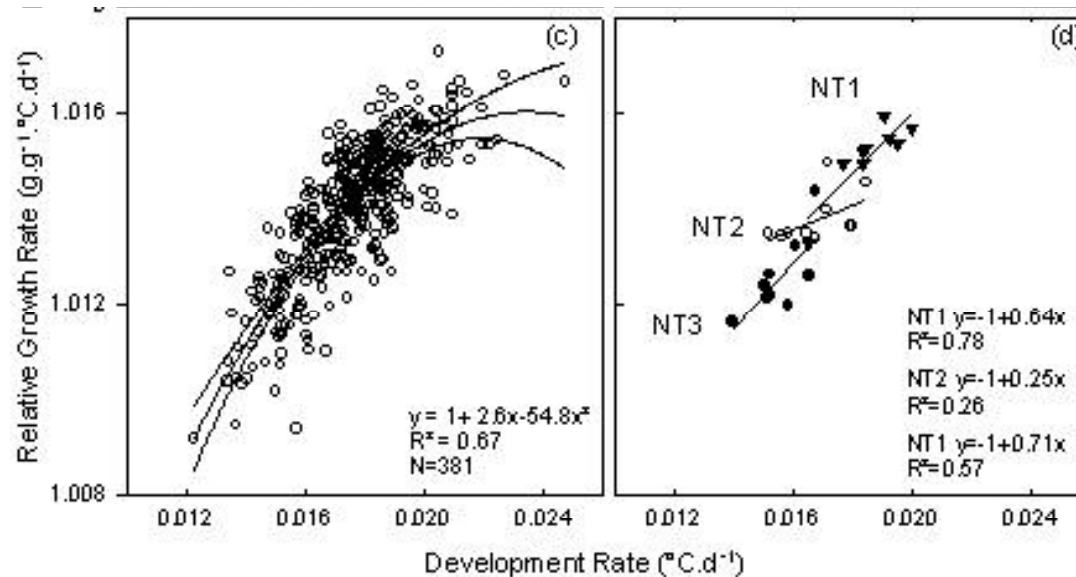
Example: Partitioning handled differently if for agronomic or genetic objectives





# Development rate DR (1/phyllchron) impact on rice early vigour

CIRAD, greenhouse (2009), 203 japonica cvs.; pot, well watered and stressed



⇒ DR main trait explaining vigor (RGR)  
under well watered and drought conditions

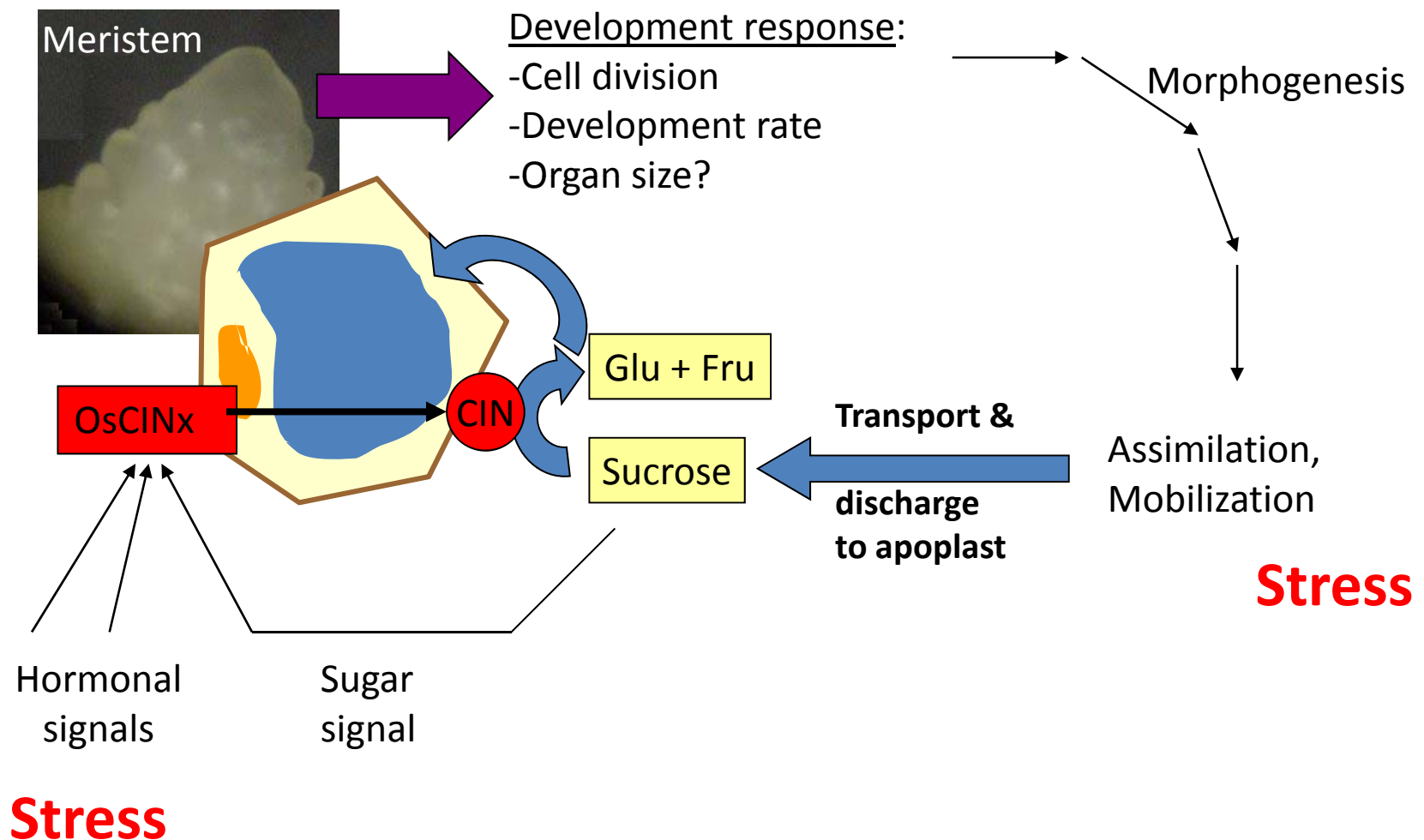
⇒ Holds up at constant tillering & leaf size

⇔ Direct effect of DR

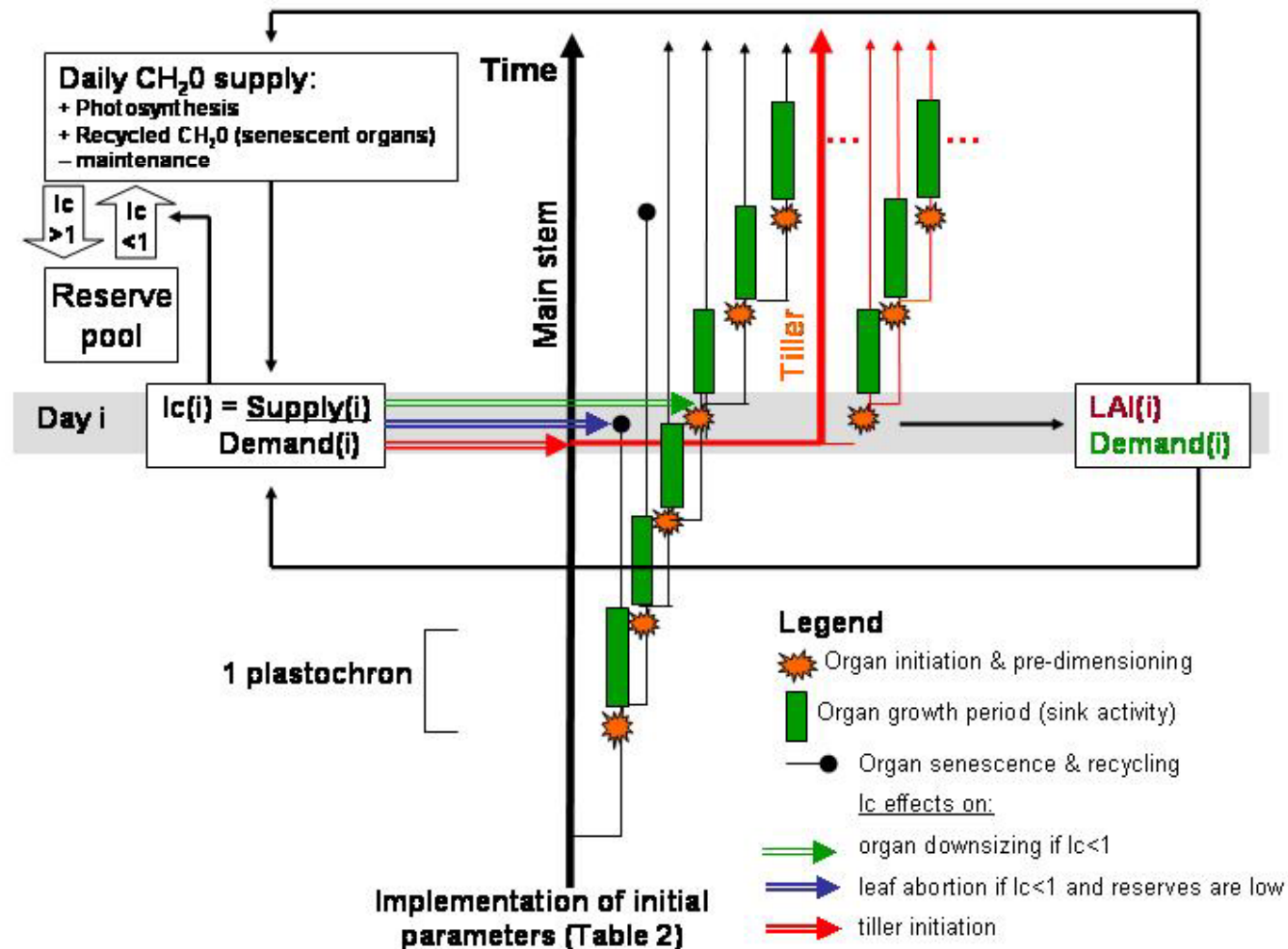
⇔ trait genetic independence?

## Issue of signaling

### Sink adjustment by growth/development process feedbacks



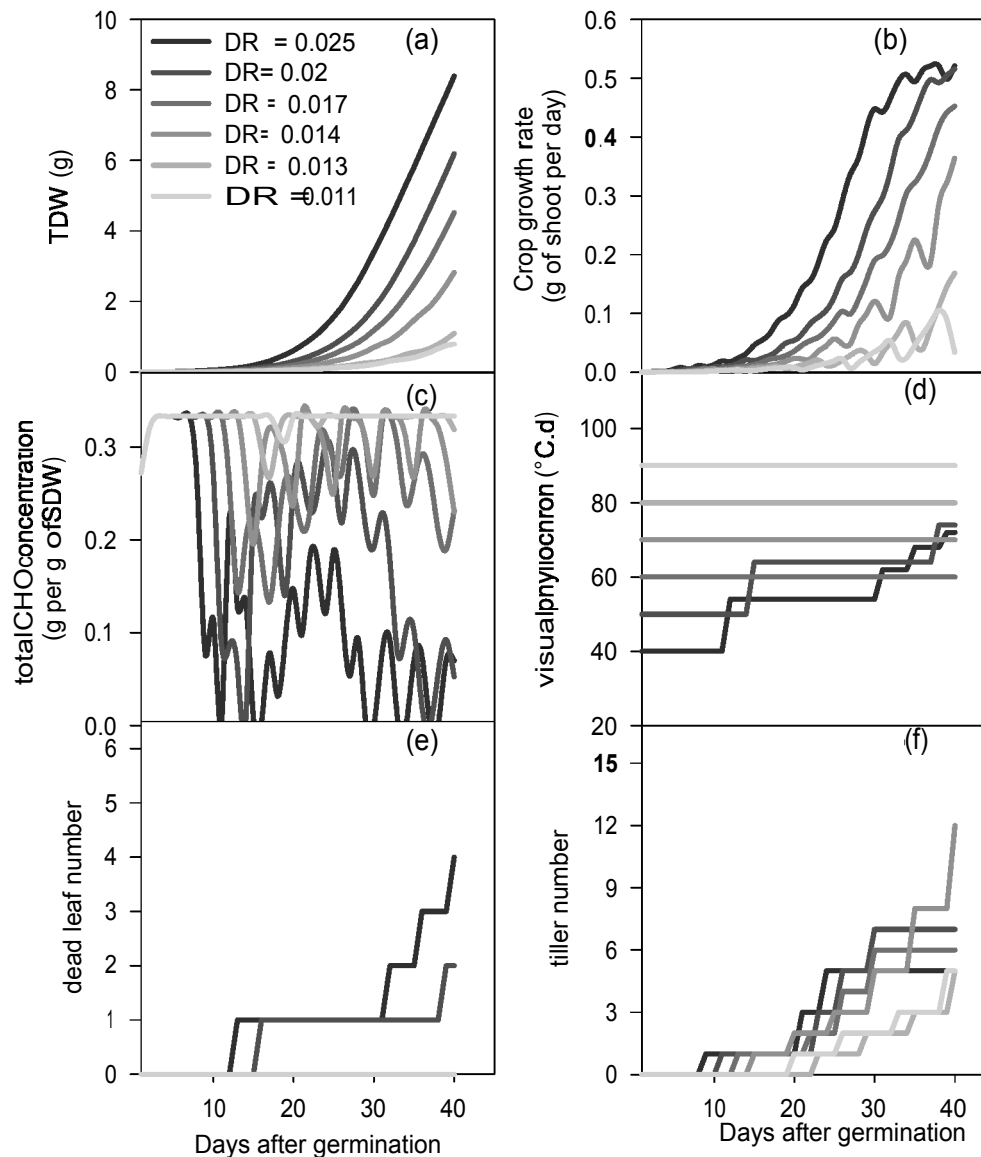
# EcoMeristem, model of phenotypic plasticity



**$Ic$  = index of internal competition = proxy for sugar availability = internal signal**

# Simulation experiment with Ecomeristem

## Source-sink processes vs. DR



**6 DR values, else parameters constant**  
40 day simulations

**Rapid DR increases...**

- growth rate
- **transitory reserve depletion**
- **tillering**

But can also cause « **trophic crisis** »

- **delayed leaf appearance**
- smaller leaves
- accelerated leaf senescence

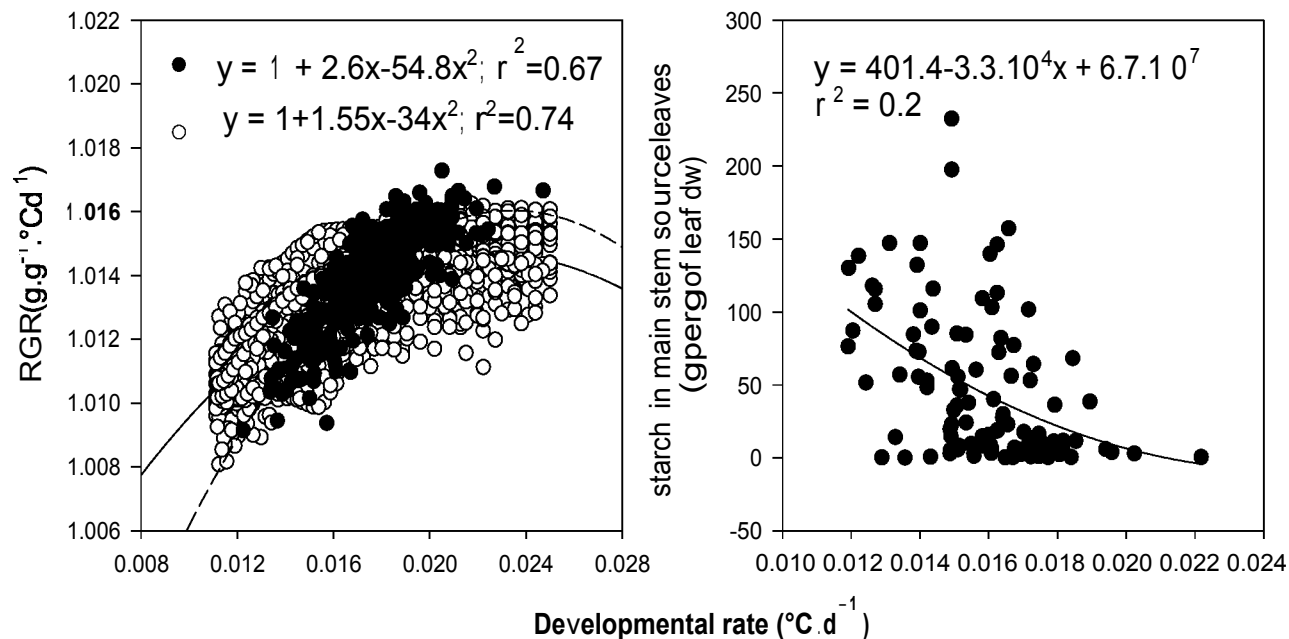
**During drought:**

- Stress more severe  
(because of greater water use)
- ... Followed by faster recovery

# Natural genetic diversity cs. potential (in-silico) diversity

Natural vs. in-silico population  
(performance of model  
parameter combinations)

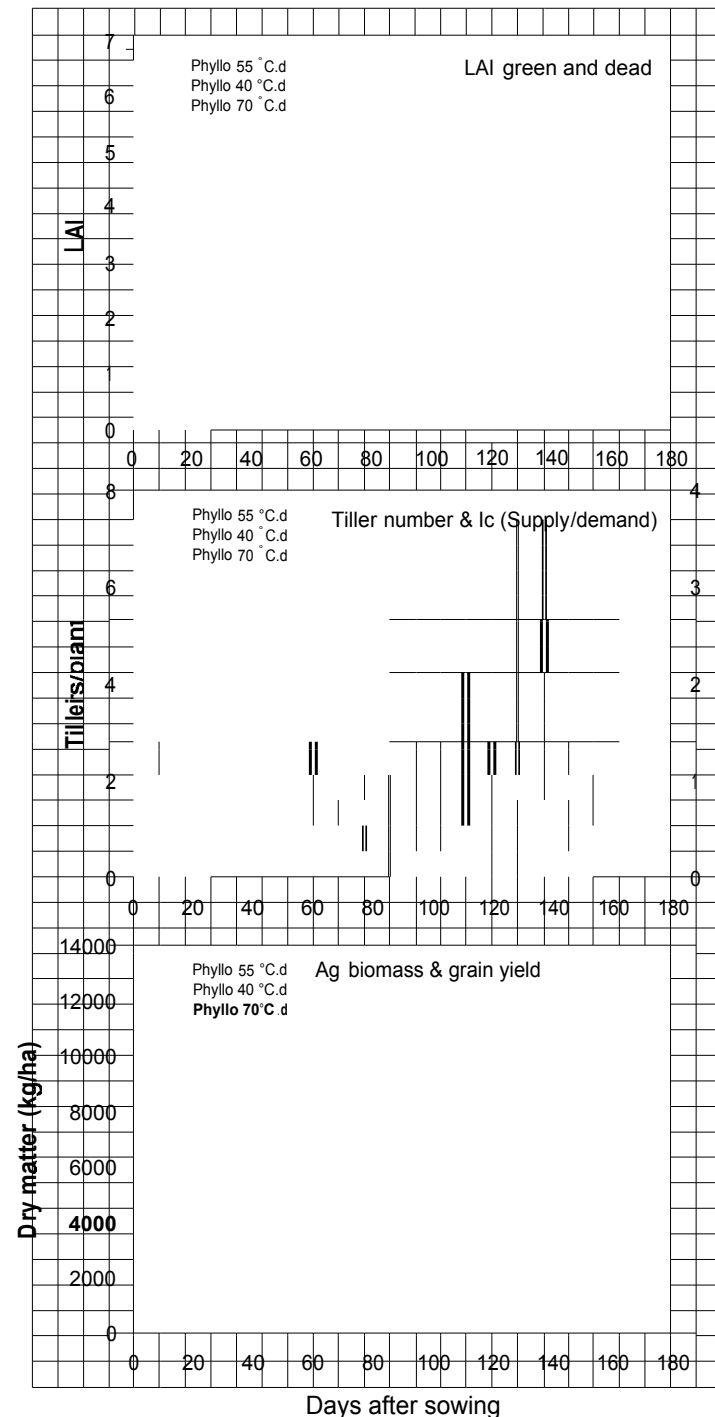
Natural relationship of  
Reserves vs. DR



Contribution of parameters  
to DR in natural population

	MGR	Ict	Epsib	plasto	Adjusted R <sup>2</sup>
1 variable				X	0,17
<b>2variables</b>			<b>X</b>	<b>X</b>	<b>0,28</b>
3 variables		X	X	X	0,52
4 variables	X	X	X	X	0,55

## SAMARA (Risocas product): Predicting GxExM of process traits in an agronomic context



Fast development increases LAI  
But leads to early leaf senescence

Fast development provides for earlier tillering  
But causes tiller abortion due to competition

Fast development affects biomass yield little  
But reduces grain yield (small panicles, poor sink)



## Outlook

### *Analytical modeling:*

Reductionist vs integrative (complex) process models

Reduce error and calibration effort for complex models

### *Phenotyping:*

Methodologies to capture regulation of key processes

Phenotype specifically, think systemically

### *Eagerly awaiting **the moment of truth**:*

Phenotyping done (w/ & w/o models): internatl. Network

**Genotyping awaits 600 K SNPs chip**

Major loci/alleles? Co-location for different stresses/traits?

*Physiologists, be ready for unexpected eye openers!*

*Merci*